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PROGRAM A - REVISIONS

Technical Monorandum

→ CDC-TM-9552-3

Fessibility Study of a
Track-While-Scan Mavigation Concept , 2 = 1

( N45# Contract to NAS1-2962 )

(October 1, 1963 2/p 65

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#### PROGRAM A REVISIONS

### Introduction and Summary

Since the publication of "Error Analysis - Program A"\* a number of revisions have taken place, some minor, others not so minor. This memorandum will detail these revisions and may generally be taken as the final descriptive report of Program A.\*\*

As will be recalled, Program A effectively simulates the scanning camera navigation device in that randomized errors are introduced into the measurements, and position and attitude error patterns calculated from these measurements are studied. In TM-9552-2 an extensive description of the program was undertaken together with derivations of some of the pertinent equations. A number of minor errors or revisions occurred there and these are corrected here.

of major importance, however, is the slight change in the navigational equations. Actually it is a change in philosophy which hinges upon which quantity to minimize in the least squares enalysis. Previously the residuals of a certain function were minimized. It seems wiser, on subsequent thinking, to minimize the residuals of the measured quantity. This is detailed in the body together with the necessary equations.

Some improvements were made in the statistical analysis section and these are also given herein, though some question can be raised as to their information content, especially concerning the chi-squared test.

<sup>\*</sup> Carroll, J.E., "Error Analysis - Program A", CDC TM-9552-2, July 29, 1963. (Hereafter referred to as TM-9552-2 in the text.)

Memoranda will of course be forthcoming on the actual program usage and also on various error analysis results.

### A. Minor Revisions

Table I lists those errata for TM-9552-2 which can be considered as minor errors in the memorandum itself or revisions to Program A. Most important are the following:

- (a) The obliquity of the ecliptic is taken at 1970.0 and is equal to 23°26'35".47.
- (b) Instead of the fifty brightest stars, 100 are chosen with the capability in the program of specifying how many are to be used. These stars with their 1970.0 equatorial coordinates are listed in Table II. Right ascension and declination were found by simple linear extrapolation from the 1950.0 positions in Atlas Coali using Annual Variation in each coordinate.
- (c) In generating random gaussian transit time arrors, the F<sub>N</sub>(x) table was extended to +3.4 sigma, thereby utilizing 99.94% of all cases, or omitting only 3 out of every 5,000.
- (d) One of the important partial derivatives had been omitted from the Appendix of TM-9552-2. It is given in Table I.

TABLE I: Minor Revisions in TM-9552-2 and in Program A

Page No.	Line	Change			
abstract	par. d	"the 100 brightest"			
3	24	"100 brightest stars with"			
10	Eq. (10)	change - to + before arcsine			
12	last	"is the obliquity of the 1970.0 ecliptic which we take as"			
13	first	"= 23°26'35".47. (6) In"			
13	ftnte	Insert: (6) Allen, C. W., Astrophysical Quantities, Athlone Press, 1963, p. 18.			
14		This table replaced by 100 brightest stars as given in Allen, Astrophysical Quantities, 1963, p. 229. (See Table II of the present memorandum.) Reference (7) also changes, therefore.			
15	Eq. (18)	$\lambda_{o_k}$ should be given in radians.			
15	6	"and G = 1.996 x 10 <sup>-47</sup> (A.U.) <sup>3</sup> /sec <sup>2</sup> gm is"			
17	1	"as RNGN. This"			
17	5-6	"from -3.4 to +3.4 in increments"			
10	1-4	Since -3.4 \$ t\$+3.4, then -3.4\sigma \leq 43.4\sigma; i.e., the assumption is made that we are only dealing with 99.94% of the possible cases. This is certainly not a serious restriction, however.			
22	Eq.(29)	- sign before M			
B-2	Eq.(B-3)	Change - to + before A			
B-3		After Eq.(B-8) and before the line: "where A and B", insert:			
		$\frac{\partial f}{\partial t_0} = A \frac{277}{77} \cos \Psi - B \frac{277}{77} \sin \Psi. \qquad (B-9)$			
		Equation numbers (B-9) - (B-11) then become (B-10) - (B-12).			

TABLE II: 100 BRIGHTEST STARS\*

GENERAL			SION**	DECLINATION**	VISUAL
CATALOGUE	(1970	).0 EQU	ATOR)	(1970.0 EQUATOR)	MAGNITUDE
NUMBER				·	
19 Add - mile - marce	h	m	S	0 1 11	
6833	6.	43.	49.5	-16, *40, *24,	-1744
8302	6,	23.	17.1	~52. *40. *44.	-,72
,19728	14.	37.	32.8	<b>-</b> 60. <b>*</b> 42. <b>*</b> 47.	· <b>~</b> . 27
19242	14.	14.	17.6	19. 20. 17.	05
25466	18.	35.	55.3	38. 45. 17.	.03
6427	5.	14.	28.1	45. 58, 12.	.09
6410	5,	13.	5.6	-8, *14, -5,	
10277	7,			5, 18, 12,	, 36
1979	1.		35.8	-57. *23. <b>*</b> 19.	. 49
18971	14,			-60. *13. *46.	.63
7451	5.		_32.8	7. 24. 12.	
27470	19.	49.		8. 47. 15.	.77
5605			_11.7	16. 27. 1.	
16952	12,		54.8	-62. *56	.83
22157	16.	_ •	_33.8	-26. +222.	,94
18144	13,		36.5	-11 *20.	.97
32000	22.		59.7	-29. *46. *54	1,16
10438	7,	43.	29.0	28. 6. 1.	1.15
26846	20	-	-	45. 10. 21.	1.25
17374	12.		_27.3 57.3	-59, *31, *31,	1.29
13926	10,			12. 6. 52.	1.34
9188	6 <u>,</u>	57	26.8	28. *55. *48.	1.48
10120	_		•	31. 57. 20.	1.56
23769	7 <u></u> 17.	32 31.	34.0		1.60
6668	5 <u>,</u>		-		
6681	<u>5</u> ,		_31.3 23.6	6, 19, 28, 28, 35, 2,	1.65
12764	9.	24.	_52.9	69*35*36	1.68
17052	12,			<b>*</b> 56. <b>*</b> 56. <b>*</b> 45.	1.68
6960	5,	29. 34.	29.3 41.3	-1. *13. *10.	<del></del> ·
30942	22,		<del></del>	<b>-47. -6. +27.</b>	1.75
17518	12,		21.0	•	
7/270		52	<u>_42.9</u>	56,7,_21,	
4041	7	00	40.0	40 45 22	4 9 0
			_10.2	49. 45. 22.	
25100	18,			<b>-34. *24. -3.</b>	1.81
15185			53.5	61. 54, 49,	
11105	8.			-47. *14. *50.	1.85
9443			10.3	<u>-26, *20, *39,</u>	
18643	13,			49. 27. 44.	1.86
23857			9.6	<u>-42,×*58, *51,</u>	1.86
7543	5,	57.	19.6	44. 55. 49.	<u>.</u> . 89
8633	6,		_58.8	16, 25, 35,	1.93
12069	8.	43.		<b>●54.</b> ★35. ★53.	1.93
22558	16.			<u>-68, *58, *32,</u>	1.93
26374	20.		17.0	-56. *50	1.94
11463	8_,	21	54.0	·=59, *24, *45,	1.94

<sup>\*</sup> Allen, C. W., Astrophysical Quantities, Athlone Press, 1963, p. 229.

<sup>\*\*</sup> Computed by linear extrapolation from 1950.0 coordinate (Atlas Coeli, 1960) using Annual Variation.

GENERAL CATALOGUE	RIGHT ASC (1970.0 EX		DECLINAT		VISUAL MAGNITUDE
NUMBER	h m	s	0 1	11	
8223	6. 21.		·=17. *56;	*23	1.96
2538			23, 19	•	** ,
2796	2 17.			*47	2.00
2243	•		89•7		
14177	10. 18.		19. 59		2.02
865		5.0	189		
20029	14 50		74. 16		2.04
13044		6.8_		*39	2.05
7264	5. 46.		=9. *40		2.06
127		49.8		30	
23837	17. 33.		12. 34		2.07
19033	14, 4,		<b>-</b> 36, *13,		2.07
1400	1. 8.			44	2.07
25941	18, 53,		-26. *20.		2.09
16953	12. 24.		<b>*62. *56.</b>		2.09
3733	3. 6.		40. 50.		2.10
18133	13, 22,		55, 4,		2,12
16189	11, 47,		. 33, 4,	. 24	
1117			14. 44.		2.15
	. 54,		60. 33.		
17262	12 39.		<u>48. *47.</u>		2.16
2477	2, 2,		42. 11.	-	2.16
31685	2240.			. ₹32	2.16
, 6847	5. 30.		. 20.		2.19
792	38,		56, 22,		2.20
24432	17. 55.		51. 29,		2.21
20947	<u> 15. 33.</u>		26. 48.		
28338	20. 21.		40. 9.		2,22
10947		31.8	-39, *55,		2.23
12623	9. 6.		<b>-43. *18.</b>		2,23
12831		17.3		*56	
147	. 7.			5.	2.26
22640		130		*26	2,29
21489	15, 58,		<b>-</b> 22. <b>*</b> 32.		2,32
18458	1337.	58.3		*53 <u> </u>	2,34
10112		2.7	200 000		2,00
519			<u>*42, *28,</u>		
30431	21. 42.		9, 44,		2,38
23988		245			2,39
19656		35.5		*38,	2,39
19856			27. 11.		
9886	7. 22.		-29. *14.		2.42
16268	<u> </u>			- 42	
29848	21. 17.	51.8	62, 27,		2,43
23158	<u> 17. 8.</u>	39.3			2,44
12938		11.1	· <b>-</b> 54. <b>*</b> 52.	*56,	27
28959		59.8		25.	2.46
32149	23. 3.	15.9	15. 2.	37.	2.49
19774		55.3	-47, *15,		
32135	23. 2.	19.0	27. 55.		2.50
21609	16 3.				
3643	3.			23.	2 * 53
15438		30.9		18	
22332	16, 35,	30.1	-10. *30.		2,56
26161	19		-29. ×55.		
16740	12. 14.	15.7	<b>-17.</b> *22.	*32.	2,58
		•	•	•	

#### B. Least Squares Navigation Computation

In TM-9552-2, the minimum data attitude and position computations are correct as given. The least squares method, however, rests on a precarious assumption and therefore must be rescued. Furthermore, it is unnecessarily complicated in that both attitude and position are computed together. They can, since stars contribute no information towards vehicle position, be evaluated separately, greatly relieving thereby the amount of computation required.

The assumption mentioned above and the ensuing problem concerns itself with the non-linearity of the function connecting the measured transit time and the vehicle unknowns. The least squares analysis developed in the Appendix to TM-9552-2 was based on minimizing the sum of the squares of the residuals of this function. When the measured value is buried in a nonlinear manner in the function, this is not in general the procedure for computing the "bast" values of the unknowns. Physically, one expects that if the measured values are believed to be normally distributed about the true value as mean, then the values or ena combacae amendana amende erecat anone a satae cortashonarish to that mean. By minimizing the sum of the squares of the function residuals, one is finding values of the unknowns which correspond to the mean of the function residuals, and these are not necessarily the same values as would correspond to the mean of the measured values. Said in other words, one certainly acts correctly in minimizing the sum of the squares of the residuals of the measured quantities, but there can arise some question as to the validity of this result when the same procedure is applied to the residuals of a function connecting

the measured and unknown quantities.

Thus we reformulate the least squares navigation computation on the following lines. Let  $f_k(x_1, x_2, \dots x_n; t_k) = 0$  represent the function connecting the measurable parameter  $t_k$  and the unknowns  $x_j$ ,  $j = 1, 2, \dots, n$ . Because of the non-linearity of  $f_k$  in the variable  $t_k$  and perhaps in some of the unknowns, we first linearize the function using assumed values  $x_j$  and  $t_k$ :

$$f_{k}' + \sum_{j=1}^{\infty} \left( \frac{\partial f_{k}}{\partial x_{j}} \right) \Delta x_{j} + \left( \frac{\partial f_{k}}{\partial t_{k}} \right) \Delta t_{k}' = 0$$
 (1)

where the primes denote evaluation at  $x_j$  and  $t_k$  and the true values are  $x_j = x_j' + \Delta x_j$ ,  $t_k = t_k' + \Delta t_k$ . Let p measurements of  $t_k$  now be made, one measurement for each k(k = 1, 2, ..., p), yielding values  $t_{km}$ . The expectation of any of these values is just the solution of (1); i.e., a linear function of the incremental unknowns  $\Delta x_j$ :

$$\mathcal{E}(t_{2m}) = t_2' - \frac{f_2' + \sum_{j=1}^{\infty} \left(\frac{\partial f_2}{\partial x_j}\right) \Delta x_j}{\left(2 + \sum_{j=1}^{\infty} \left(\frac{\partial f_2}{\partial x_j}\right) \Delta x_j}.$$
 (2)

The Gauss-Markoff theorems states that the best unbiased linear least squares estimates  $\Delta x_j$  are those values of the  $\Delta x_j$  that minimize the sum of squares

$$S = \sum_{k=1}^{p} \left( t_{km} - \mathcal{E} \left( t_{km} \right) \right)^{2} w_{k}$$
 (3)

<sup>\*</sup> Trumpler and Weaver, Statistical Astronomy, Dover Press, New York, 1953, p. 182.

where  $\mathbf{w}_k$  is a weighting function dependent on the variance  $\sigma_k^{\;2}$  of  $t_{km}$ .

In our navigational problem, all of the measurements are assumed performed in the same manner with the same instrument on essentially identical targets.\* Thus all of the  $\mathbf{w}_k$  are the same and can be dropped from the notation. Furthermore, for lack of any better estimate, we let  $\mathbf{t}_k$  =  $\mathbf{t}_{km}$ . That is, we evaluate the function and its partials at the measured value  $\mathbf{t}_{km}$  since this represents a highly accurate approximation to the true  $\mathbf{t}_k$ .

The equations from which the  $\Delta x_j$  are calculated come from minimizing S with respect to the unknowns:

$$\frac{\partial S}{\partial \Delta n_j} = 0 \quad , \quad j = 1, 2, \dots, m . \tag{4}$$

Substituting  $t_{km}$  for  $t_k^{\ t}$ , Equation (2) in Equation (3), carrying out the differentiations, and rearranging terms, gives, finally, the solution

$$\widetilde{\Delta X} = M^{-1}B \tag{5}$$

where  $\widehat{\Delta X}$  is a n x 1 column vector whose elements are the  $\Delta x_j$ , M is an n x n square matrix with elements  $a_{ij}$ :

$$a_{ij} = \sum_{k=1}^{p} \frac{(\partial f_{k}/\partial n_{i})'(\partial f_{k}/\partial n_{j})'}{(\partial f_{k}/\partial f_{k})'^{2}}$$
(6)

In a future program, the target measurement errors will differ depending on their magnitude.

and B is an n x 1 column vector whose elements are c;

$$c_i = -\sum_{k=1}^{p} \frac{f_k'(\partial f_k/\partial x_i)'}{(\partial f_k/\partial f_k)'^2}$$
 (7)

The difference between these coefficients and those in TM-9552-2 (Equations (40)-(41)) are that the former have  $(\partial f_k/\partial t_k)^{1/2}$  in the denominator, acting somewhat as a weighting function. This is only a slight modification while the philosophical outlook is quite different and, with the present analysis, more convincing.

In our navigational problem, the function  $f_k$  is linear in the position coordinates X, Y, Z of the vehicle, but nonlinear in the attitude parameters  $\theta$ ,  $\varphi$ ,  $t_0$  and also in the transit time  $t_k$ . In addition, the coefficients of the position coordinates are themselves nonlinear in the attitude parameters and transit time. We can thus write  $f_k$  as

$$f_{\underline{x}} = X a_{\underline{x}}(\theta, \beta, t_0; t_{\underline{x}}) + Y b_{\underline{x}}(\theta, \beta, t_0; t_{\underline{x}})$$

$$+ Z c_{\underline{x}}(\theta, \beta, t_0; t_{\underline{x}}) + d_{\underline{x}}(\theta, \beta, t_0; t_{\underline{x}}) = 0.$$

From a set of transit time measurements (one measurement for each k) the position coordinates and attitude parameters are to be computed. This will be done separately; that is the attitude parameters will be computed using only star transit time data (here the f is not a function of X, Y, Z), while the position of the vehicle will be derived only from planet transit times. Neither will be assumed to affect the other.

This last point requires some discussion. In an actual navigation situation, the attitude, even though it be determined only by stars, is used in computing quantities for the position determination. That is, the vehicle attitude must be known before position can be found. Thus, any errors in attitude will probably contribute errors to the position.

We are more interested at the present time, however, in deducing how fundamental transit time errors affect attitude and position separately. At some later date, their mutual influences will be examined. Therefore, in Program A, we will compute the vehicle position using for the attitude its true values. (To date there is no similar dependence of attitude on position—only stars are used for attitude.)

The computation of attitude will thus proceed as follows. Equation (5) can be written as

$$\begin{pmatrix} \Delta \Theta \\ \Delta \phi \\ \Delta t_0 \end{pmatrix} = M^{-1} B \tag{9}$$

where M and B have their elements specified by Equations (6) and (7). The runction and partial derivatives their shown are evaluated at the true values of the attitude specified at the start of the program and at the measured value of the transit time  $t_{\rm km}$ . The primes denote such an evaluation. The explicit forms are shown in the Appendix to TM-9552-2, Equations (B-1)-(B-3)\* and in Equations (25)-(28) in the body of the memorandum. (It will be noticed that  $\partial f_{\rm k}/\partial t_{\rm k} = -\partial f_{\rm k}/\partial t_{\rm o}$ .)

The computation of position is quite similar. At first sight a significant improvement might seem possible due to the linearity of the function in the position coordinates. This is not so because of the dependence of a, b, c in Equation (8) on  $t_k$ . Attempting to compute the

<sup>\*</sup> Equation (B-3) should have a plus sign in front of A.

position rather than the increments in position will thus result in a quadratic or worse in three unknowns.

To escape this complexity and still compute the position directly we will use assumed values of X, Y, Z for  $\partial f_k / \partial t_k$ . In the form (8) we note that  $\partial f/\partial X = a$ ,  $\partial f/\partial Y = b$ ,  $\partial f/\partial Z = c$  so that on substituting into (6) and (7) the vehicle position becomes

$$\begin{pmatrix} X \\ Y \\ Z \end{pmatrix} = M^{-1} B \tag{10}$$

where M is a symmetric matrix with elements

$$a_{11} = \sum_{k=1}^{p} \frac{{a'_{k}}^{2}}{(2t_{k}/2t_{k})^{2}}$$
 (11)

$$a_{22} = \sum_{k=1}^{r} \frac{b_{k}^{'2}}{(3f_{k}/3f_{k})^{'2}}$$
 (12)

$$a_{33} = \sum_{k=1}^{p} \frac{c_{k}^{2}}{(2f_{k}/2f_{k})^{2}}$$
 (13)

$$a_{12} = \sum_{k=1}^{p} \frac{a'_{k}b'_{k}}{(2f_{k}/2t_{k})^{2}}$$
 (14)

$$a_{13} = \sum_{k=1}^{p} \frac{a'_{k} c'_{k}}{(\partial f_{k} / \partial f_{k})^{2}}$$
 (15)

$$a_{23} = \sum_{k=1}^{p} \frac{b_{k}' c_{k}'}{(\partial f_{k} / \partial f_{k})^{2}}$$
 (16)

$$a_{ij} = a_{ji} \tag{17}$$

and B is a column vector with elements

$$c_{i} = -\sum_{k=1}^{p} \frac{d_{k}' a_{k}'}{(\partial f_{k} / \partial f_{k})^{2}}$$
 (18)

$$c_2 = -\frac{\sum_{k=1}^{p} \frac{d_k' b_k'}{(\partial f_k / \partial f_k)^2}}{(\partial f_k / \partial f_k)^2}$$
 (19)

$$c_3 = -\sum_{k=1}^{\infty} \frac{d_k c_k'}{(\partial f_k / \partial f_k)'^2}$$
 (20)

The explicit forms are to be found in Equations (33)-(36) in TM-9552-2 and from Equation (B-9)\* in Appendix B to that memorandum. (Again note that  $\partial f_k/\partial t_k = -\partial f_k/\partial t_0$ .) These matrix elements are all evaluated at the true values X, Y, Z,  $\theta$ ,  $\varphi$ ,  $t_0$  and at the measured transit time  $t_{km}$ . Thus many of the quantities can be compute before

<sup>\*</sup> Equation (B-9) is identical to Equation (B-3) and should have been included immediately after (B-8) and just before the line of text: "where A and B are...". The Equations (B-9)-(B-11) become numbered (B-10)-(B-12).

the Monte Carlo process in Program A leaving only simple manipulations after the measured time  $t_{\rm km}$  becomes known. This is also true for attitude, of course.

## C. Statistical Analysis

The method of analyzing the list of errors in any of the six attitude and position values has been altered to the extent of computing additional moments of the distribution, plotting the distribution, and subjecting it to a chi-squared test.

For computation of distribution moments, let each entry be represented by  $\mathbf{x}_{i}$ . Then

$$\chi' = \frac{1}{n} \sum_{i=1}^{m} \chi_i^{\Lambda} \tag{11}$$

are computed for r=1, 2, 3, and 4. These are the first four moments of the distribution about the origin.\* They are related to the central moments (moments about the mean value  $\bar{x}$ ),  $\mu_r$ , through

$$\begin{array}{c}
\mu_{1} = 0 \\
\mu_{2} = \nu_{2} - \nu_{1}^{2} = \sigma^{2} \\
\mu_{3} = \nu_{3}^{2} - 3\nu_{2}\nu_{1} + 2\nu_{1}^{3} \\
\mu_{4} = \nu_{4} - 4\nu_{3}^{2}\nu_{1} + 6\nu_{3}\nu_{1}^{2} - 3\nu_{1}^{4}
\end{array}$$
(12)

and

$$\begin{aligned}
 \nu_{1} &= \bar{x} \\
 \nu_{2} &= \mathcal{N}_{2} + \nu_{1}^{2} \\
 \nu_{3} &= \mathcal{N}_{3} + 3\mathcal{N}_{2} \nu_{1} + \nu_{1}^{3} \\
 \nu_{4} &= \mathcal{N}_{4} + 4\mathcal{N}_{3} \nu_{1} + 6\mathcal{N}_{2} \nu_{1}^{2} + \nu_{1}^{4}
 \end{aligned}$$
(13)

Burington and May, Handbook of Probability and Statistics with Tables, Handbook Publishers Inc., Sandusky, Ohio, 1958, p. 9. 10.

Also computed are: (a) the coefficient of skewness\*

$$Y_1 = \mu_3 / \sigma^3 \tag{14}$$

which indicates the asymmetry of the distribution about the mean  $(\gamma_1 > 0 \text{ indicates a "long tail" to the right while <math>\gamma_1 < 0 \text{ indicates}$  a similar feature on the left) and (b) the coefficient of excess\*

$$\delta_{a} = \left( \mu_{y} / \sigma^{4} \right) - 3 \tag{15}$$

which is a measure of the degree of "flattening" (kurtosis) of the distribution near its center.

The computation of these moments and coefficients will define the sample distribution quite well, since, for a normal distribution about mean zero,

$$\mathcal{L}_{\lambda} = \mathcal{L}_{\lambda}, \quad \mathcal{S}_{1} = \mathcal{S}_{2} = 0$$

$$\mathcal{L}_{\lambda} = \mathcal{L}_{1} = \mathcal{L}_{2} = \cdots = 0$$
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Checking these against the sample values will clearly show the extent to which the individual errors are normally distributed.

For visual analysis, a plot is generated of the distribution of points. It is presented along with the listing of the cumulative distribution. (See Appendix A of TM-9552-4 for a typical print-out.)

<sup>\*</sup> Eurington and May, Handbook of Probability and Statistics with Tables, Handbook Publishers Inc., Sandusky, Ohio, 1958, p. 13, 23, 24.

To further accumulate data concerning each distribution, a chisquared test is performed on the fit of the sample to a normal distribution.\* Having already found the sample mean x and standard deviation

of, and having generated a cumulative distribution over r intervals

each of size h, we can compute, for the mid-point x; of each interval,
the quantities

$$t_i = \frac{(x_i - \bar{x})}{\sigma}$$
,  $P_i = \frac{k}{\sigma \sqrt{2\pi}} e^{-t_i^2/2}$ . (17)

The cumulative distribution also reveals the number of points in each interval  $N_{\rm p}$ . If the total number of points is  $N_{\rm p}$ , we now form the sum

$$\chi^{2} = \sum_{i=1}^{\Lambda} (N_{i} - N_{T} P_{i})^{2} / N_{T} P_{i}$$
 (18)

and from it the quantity

$$t_{\chi} = \sqrt{2\chi^2} - \sqrt{2\chi - 7} . \tag{19}$$

Either  $\chi^2$  or  $t_{\chi}$  can be used to determine the probability that the sample was taken from a normally distributed population. If a large number of sample sets are taken, and  $\chi^2$  computer for each set, it will be found that  $\chi^2$  is distributed according to a  $\chi^2$  distribution\*\* with parameter m. This latter is the number of degrees of freedom pessessed by the sample and is equal to r-1 -b where b is the number of distribution parameters computed from the sample. Here b = 2 so that m=r-3,

<sup>\*</sup> Burington and May, p.180.

<sup>\*\*</sup> Ibid., p. 141, Teble XIV.

or three less than the number of intervals. If m is large enough, say m > 30, then t<sub>X</sub> is distributed normally about zero mean with unit standard deviation.

To determine to what degree of confidence we can state that a set of sample points comes from a normal distribution, we compute x and  $\sigma$ , select r, and find  $\chi^2$  and  $t_{\chi^*}$ . Let us assume for the moment that m < 30. Then the value of  $\chi^2$  can be compared to a table such as Table XIV in Burington and May.\* For example if m = 20 and  $\chi^2 = 37.566$ , then the table states that < = .01. This means the following: if the sample set from which  $\chi^2$  was computed actually came from a normally distributed population, then only 1% of the time could x2 be expected to be greater or equal to 37.566 for m = 20. One would be tempted to say, then, that this sample has a low probability of coming from a normal population. Usually a level is chosen such as e = .05, .01, or .001 such that the statement: 'within a confidence level of 5%, the given sample does not come from a normally distributed population" can be made. Take another example, say m = 15,  $\chi^2$  = 8. Such a sample almost derinitary comes from a normal population since over 90% of the samples from this population will have values of  $\chi^2 > 8$  for m = 15.

When  $m \ge 30$ , the  $\chi^2$  distribution become normal so that  $t_{\chi}$  is the useful parameter. This value is compared in a similar manner to a table such as Table III in this memorandum.\*\* Again, if the sample from which  $t_{\chi}$  is computed actually comes from a normal population, then a certain fraction  $\epsilon$  of the time,  $t \ge t_{\chi}$ . If this fraction is low,

<sup>\*</sup> Ibid, p. 286.

<sup>\*\*</sup> Table III is compiled from Table IX of Burington and May by simple additions or subtractions.

		A 2	-r <sup>a</sup> /adr = E
E	t e		
.9987 .9974 .9953 .9918 .9861 .9773 .9713 .9641 .9554 .9452 .9332 .9192 .9192 .9032 .8849 .8643 .8413 .8159 .7881 .7580 .7258 .6915 .6554 .6179 .5793 .5398	3.0 .46 2.8 .42 2.6 .38 2.4 .34 2.2 .30 2.9 .27 1.9 .24 1.5 .13 1.5 .13 1.5 .13 1.5 .13 1.7 .18 1.7 .18 1.7 .18 1.7 .18 1.7 .18 1.7 .18 1.7 .18 1.7 .18 1.8 .21 1.7 .18 1.9 .24 1.1 .06 1.0 .05 1.1 .06 1.0 .05 1.1 .06 1.1 .0	1002 +0.1 1007 .2 121 .3 146 .4 185 .5 142 .6 120 .7 1.19 .8 141 .9 157 1.1 157 1.1 158 1.3 168 1.3 168 1.5 168 1.5	

the sample itself is certainly not very normal and has a low probability of coming from a normal population. In a manner similar to the  $\chi^2$  case, confidence levels of 5%, 1% or .1% are usually chosen as decision points. To take an example, let m=56,  $t_{\chi}=2$ . Then 6  $\sim$  .023 means that the particular sample only has about a 2% chance of coming from a normal population and thus is rejected on a 5% level but accepted on a 1% level.